Optional Lab: Linear Regression using Scikit-Learn

There is an open-source, commercially usable machine learning toolkit called scikit-learn. This toolkit contains implementations of many of the algorithms that you will work with in this course.

Goals

In this lab you will:

- Utilize scikit-learn to implement linear regression using a close form solution based on the normal equation

Tools

You will utilize functions from scikit-learn as well as matplotlib and NumPy.

In [1]:
```
import numpy as np
import matplotlib.pyplot as plt
from sklearn.linear_model import LinearRegression
from lab_utils_multi import load_house_data
#plt.style.use('./deeplearning.mplstyle')
np.set_printoptions(precision=2)
```

Out[1]:
```
<Token var=<ContextVar name='format_options' default={'edgeitems': 3, 'threshold': 1000, 'floatmode': 'maxprec', 'precision': 8, 'suppress': False, '
linewidth': 75, 'nanstr': 'nan', 'infstr': 'inf', 'sign': '-', 'formatter': None, 'legacy': 9223372036854775807, 'override_repr': None} at 0x0000024C
F23458F0> at 0x0000024CF72D3280>
```

Linear Regression, closed-form solution

Scikit-learn has the linear regression model which implements a closed-form linear regression.

Let's use the data from the early labs - a house with 1000 square feet sold for $300,000 and a house with 2000 square feet sold for $500,000.

Size (1000 sqft)	Price (1000s of dollars)
1	300
2	500

Load the data set

In [2]:
```
X_train = np.array([1.0, 2.0])   #features
y_train = np.array([300, 500])   #target value
```

Create and fit the model

The code below performs regression using scikit-learn. The first step creates a regression object.
The second step utilizes one of the methods associated with the object, `fit`. This performs regression, fitting the parameters to the input data. The toolkit expects a two-dimensional X matrix.

In [3]:
```
linear_model = LinearRegression()
#X must be a 2-D Matrix
linear_model.fit(X_train.reshape(-1, 1), y_train)
```

Out[3]:
```
LinearRegression()
```

View Parameters

The $\mathbf{w}$ and $\mathbf{b}$ parameters are referred to as 'coefficients' and 'intercept' in scikit-learn.

In [4]:
```
b = linear_model.intercept_
w = linear_model.coef_
print(f"w = {w:}, b = {b:0.2f}")
print(f"'manual' prediction: f_wb = wx+b : {1200*w + b}")
```

```
w = [200.], b = 100.00
'manual' prediction: f_wb = wx+b : [240100.]
```

Make Predictions

Calling the `predict` function generates predictions.

In [5]:
```
y_pred = linear_model.predict(X_train.reshape(-1, 1))

print("Prediction on training set:", y_pred)
```

```
X_test = np.array([[1200]])
print(f"Prediction for 1200 sqft house: ${linear_model.predict(X_test)[0]:0.2f}")
```

```
Prediction on training set: [300. 500.]
Prediction for 1200 sqft house: $240100.00
```

Second Example

The second example is from an earlier lab with multiple features. The final parameter values and predictions are very close to the results from the un-normalized 'long-run' from that lab. That un-normalized run took hours to produce results, while this is nearly instantaneous. The closed-form solution work well on smaller data sets such as these but can be computationally demanding on larger data sets.

> The closed-form solution does not require normalization.

In [6]:
```
# load the dataset
X_train, y_train = load_house_data()
X_features = ['size(sqft)','bedrooms','floors','age']
```

In [7]:
```
linear_model = LinearRegression()
linear_model.fit(X_train, y_train)
```

Out[7]:
```
LinearRegression()
```

In [8]:
```
b = linear_model.intercept_
w = linear_model.coef_
print(f"w = {w:}, b = {b:0.2f}")
```

```
w = [  0.27 -32.62 -67.25  -1.47], b = 220.42
```

In [10]:
```
print(f"Prediction on training set:\n {linear_model.predict(X_train)[:4]}" )
print(f"prediction using w,b:\n {(X_train @ w + b)[:4]}")
print(f"Target values \n {y_train[:4]}")

x_house = np.array([1200, 3,1, 40]).reshape(-1,4)
x_house_predict = linear_model.predict(x_house)[0]
print(f" predicted price of a house with 1200 sqft, 3 bedrooms, 1 floor, 40 years old = ${x_house_predict*1000:0.2f}")
```

```
Prediction on training set:
 [295.18 485.98 389.52 492.15]
prediction using w,b:
 [295.18 485.98 389.52 492.15]
Target values
 [300.  509.8 394.  540. ]
 predicted price of a house with 1200 sqft, 3 bedrooms, 1 floor, 40 years old = $318709.09
```

Congratulations!

In this lab you:

- utilized an open-source machine learning toolkit, scikit-learn
- implemented linear regression using a close-form solution from that toolkit

In [ ]:
```
```